Sentiment Analysis of Tweets in Three Indian Languages: Supplementary Material

1 Description

We include six tables here, corresponding to three languages (Bengali, Hindi, and Tamil), and 2-class and 3-class classification on them. All numbers reported are percentage accuracy values (microaveraged) in 10-fold cross-validation on the training data of the corresponding language.

- 1. Table 1: Bengali, 2-class classification.
- 2. Table 2: Bengali, 3-class classification.
- 3. Table 3: Hindi, 2-class classification.
- 4. Table 4: Hindi, 3-class classification.
- 5. Table 5: Tamil, 2-class classification.
- 6. Table 6: Tamil, 3-class classification.

Feature Representation	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
	Surface features		51.66	53.88	48.81	50.87	52.61	49.29
Binary (Presence/Absence)	SentiWordNet		56.1	56.1	56.1	56.1	56.1	56.1
	Word unigrams	AW	67.67	64.03	59.75	59.75	56.1	64.03
		NS	65.61	62.28	56.89	60.22	56.1	62.28
		OS	56.26	56.89	55.94	56.74	56.1	56.89
	Word bigrams	AW	60.86	58.64	55.47	59.27	56.1	57.53
		NS	57.21	58.95	51.51	58.64	56.1	57.69
	337 1.	OS	56.42	55.78	55.78	55.47	56.1	54.83
	Word trigrams	AW	57.37	59.43	51.19	53.25	56.1	58.95
		NS OS	56.26	59.43	53.09	53.09	56.1	58.95
	Character unigrams	AC	56.1 55.78	56.1 57.05	55.94 50.55	56.1 56.89	56.1 55.63	56.1 57.69
	Character unigrams	SS	55.78	56.89	49.92	56.58	55.47	57.37
		PP	53.88	56.42	49.6	56.42	56.74	56.58
		SP	53.88	56.58	52.3	54.83	56.74	56.58
	Character bigrams	AC	51.82	53.09	53.88	58.16	56.1	51.66
		SS	51.19	52.93	55.78	56.89	56.1	52.3
		PP	52.46	53.41	54.04	58.8	56.1	54.2
		SP	52.14	54.52	58.8	59.75	56.1	54.68
	Character trigrams	AC	54.04	56.1	53.57	58.16	56.1	53.72
		SS	50.55	52.14	49.45	55.47	56.1	51.98
		PP	52.77	55.47	53.72	60.38	56.1	52.61
		SP	52.3	51.51	54.68	58.32	56.1	50.71
Tf (Term Frequency)	SentiWordNet		56.1	56.1	56.1	56.1	56.1	56.1
	Word unigrams	AW	67.35	64.66	59.43	59.59	56.1	64.82
		NS	66.88	62.76	58.48	59.9	56.1	62.12
	****	OS	57.05	58.16	55.31	56.58	56.1	57.37
	Word bigrams	AW	60.86	58.64	52.61	59.43	56.1	57.53
		NS OS	57.05	58.64	52.93	58.64	56.1	57.84
	Word trigrams	AW	56.26 57.53	55.78 59.43	55.63 50.71	55.31 53.25	56.1 56.1	54.83 58.95
	word digrams	NS NS	56.26	59.43	50.71	53.25	56.1	58.95
		OS	56.1	56.1	56.26	56.1	56.1	56.1
	Character unigrams	AC	55.63	58.48	50.55	58.0	56.42	54.04
	Character unigrams	SS	55.78	57.53	49.13	58.0	54.99	54.83
		PP	55.78	58.32	47.7	55.31	57.84	56.26
		SP	55.47	58.8	50.87	56.74	55.94	51.66
	Character bigrams	AC	53.57	54.83	51.66	57.21	56.1	53.41
		SS	51.51	54.68	51.35	57.21	55.94	53.41
		PP	53.09	53.72	53.57	57.69	55.94	52.93
		SP	53.09	55.31	55.63	58.8	56.1	52.77
	Character trigrams	AC	55.78	54.68	52.77	57.05	56.1	55.47
		SS	52.14	53.25	48.81	58.48	56.1	53.09
		PP	54.99	56.42	55.63	59.9	56.1	54.83
		SP	54.52	55.78	55.15	58.8	56.1	53.25
Tfidf (Term Frequency	SentiWordNet	4337	56.1	56.1	56.1	56.1	56.1	56.1
Inverse Document Frequency)	Word unigrams	AW	67.67	64.18	60.38	59.59	56.1	63.39
		NS	67.83	64.34	59.11	59.9 56.58	56.1	63.39
	Word bigrams	OS AW	57.05 58.0	57.53 58.16	54.36		56.74 56.1	57.21 58.32
	word digrams	NS NS	56.58	57.21	53.88 51.98	59.43 58.64	56.1	57.21
		OS	56.89	54.52	55.15	55.31	56.1	54.2
	Word trigrams	AW	57.21	58.95	54.04	53.25	56.1	54.04
	Word digrams	NS	56.26	58.95	50.55	53.09	56.1	53.72
		OS	57.69	56.1	56.1	56.1	56.1	56.1
	Character unigrams	AC	54.83	57.21	47.7	58.16	57.05	58.8
		SS	54.83	57.21	48.18	58.0	57.05	58.95
		PP	54.04	58.32	48.81	57.37	56.26	58.48
		SP	54.04	58.32	51.82	56.74	56.26	58.48
	Character bigrams	AC	51.66	56.89	49.13	57.21	55.31	57.37
		SS	51.19	56.74	51.35	57.21	55.47	56.1
		PP	48.65	50.55	53.09	57.69	55.94	49.92
		SP	51.35	55.15	55.47	58.8	55.94	52.77
	Character trigrams	AC	54.04	57.37	55.63	57.05	55.78	57.53
		SS	53.09	56.58	51.19	58.48	55.78	53.72
	1	PP	50.87	56.58	56.74	59.9	56.1	53.57
		SP	51.82	53.72	52.93	58.8	55.94	52.3

Table 1: % accuracy of 2-class classification for Bengali on 10-fold cross-validation on the training data. AW = all words, NS = all words except stop words, OS = only stop words. AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.

	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
	Surface features		34.43	42.64	34.93	38.14	39.44	36.44
Binary (Presence/Absence)	SentiWordNet		36.84	36.84	36.84	36.84	36.84	36.84
	Word unigrams	AW	47.65	51.25	47.75	48.05	36.84	50.05
		NS	46.95	49.85	44.14	49.35	36.84	50.15
		OS	37.74	39.54	39.84	39.84	37.74	39.24
	Word bigrams	AW	45.45	48.55	44.74	46.05	36.84	48.15
		NS	43.84	47.45	44.04	45.75	36.84	47.55
		OS	36.14	36.04	37.64	38.14	36.84	35.44
	Word trigrams	AW	42.34	46.35	43.84	44.54	36.84	46.35
		NS	42.04	45.95	42.74	44.14	36.84	45.35
		OS	35.44	36.84	36.04	36.04	36.84	36.24
	Character unigrams	AC	39.14	43.34	38.14	45.95	40.24	43.54
		SS	39.24	43.44	38.04	44.84	40.24	43.34
		PP	36.74	41.34	39.54	43.14	40.04	41.54
		SP	36.84	41.14	39.34	43.34	40.04	41.54
	Character bigrams	AC	37.24	39.24	40.04	43.44	36.84	40.54
		SS	38.04	38.74	37.14	44.14	36.84	38.44
		PP	37.24	39.44	39.34	44.14	36.84	39.94
		SP	36.54	39.84	38.84	44.34	36.84	37.44
	Character trigrams	AC	38.24	41.04	39.14	44.44	36.84	40.94
		SS	36.94	39.44	35.74	45.25	36.84	37.04
		PP	36.84	38.34	37.34	47.75	36.84	37.84
		SP	37.64	38.04	41.54	44.94	36.84	36.14
Tf (Term Frequency)	SentiWordNet		36.84	36.84	36.84	36.84	36.84	36.84
	Word unigrams	AW	49.85	50.45	47.55	48.75	36.84	50.55
		NS	47.55	50.85	44.14	49.05	36.84	50.75
		OS	38.04	39.64	37.54	38.54	37.74	39.44
	Word bigrams	AW	45.45	48.75	46.15	46.15	36.84	48.45
		NS	43.84	47.55	44.54	44.54	36.84	47.65
		OS	36.44	35.64	37.84	38.04	36.84	35.54
	Word trigrams	AW	42.74	46.45	44.64	44.74	36.84	46.35
	_	NS	42.04	45.95	42.04	44.14	36.84	45.35
		OS	35.44	36.84	35.94	36.04	36.84	36.24
	Character unigrams	AC	41.54	45.95	38.84	44.94	43.14	39.84
	_	SS	41.84	46.05	39.14	44.84	43.44	38.44
		PP	40.14	44.04	39.94	44.04	43.54	41.14
		SP	39.84	44.84	39.54	43.44	44.24	40.54
	Character bigrams	AC	39.84	40.04	41.04	42.74	42.74	39.34
		SS	37.54	41.24	40.44	42.84	43.44	41.24
		PP	39.04	39.74	37.34	44.34	42.44	38.74
		SP	38.74	42.14	39.34	44.54	42.94	40.34
	Character trigrams	AC	40.14	40.84	38.34	43.94	38.54	40.84
		SS	38.24	42.64	39.64	43.74	38.94	41.14
		PP	40.14	41.54	37.34	46.75	39.24	40.94
		SP	40.54	43.14	38.54	46.15	39.14	40.84
Tfidf (Term Frequency	SentiWordNet		36.84	36.84	36.84	36.84	36.84	36.84
Inverse Document Frequency)	Word unigrams	AW	47.65	48.55	47.45	48.75	36.84	49.55
		NS	46.75	50.55	47.55	49.05	36.84	50.75
		os	36.84	39.74	38.14	38.54	37.54	39.84
	Word bigrams	AW	41.64	47.75	44.74	46.15	36.84	48.15
	_	NS	39.24	47.85	43.84	44.54	36.84	45.65
		os	36.34	36.24	37.84	38.04	36.84	36.34
	Word trigrams	AW	38.74	45.95	43.14	44.74	36.84	44.64
		NS	38.04	45.15	43.54	44.14	36.84	41.94
		os	35.74	36.14	36.04	36.04	36.84	36.24
	Character unigrams	AC	39.24	45.45	40.94	45.15	43.84	44.24
		SS	39.24	45.45	41.74	44.84	43.74	44.54
		PP	37.54	42.54	40.44	44.04	39.94	41.34
		SP	37.54	42.54	40.84	43.44	40.04	41.54
	Character bigrams	AC	36.24	40.04	39.24	42.74	38.54	39.54
		SS	36.14	38.84	39.04	42.84	37.64	36.94
		PP	34.53	38.84	39.14	44.34	37.54	37.84
		SP	35.24	40.44	39.94	44.54	36.54	40.84
	Character trigrams	AC	38.24	41.64	39.74	43.94	36.64	40.64
		SS	37.84	41.24	40.34	43.74	36.54	41.14
		PP	36.54	41.24	36.94	46.75	36.94	38.74
		SP	36.64	41.74	38.04	46.15	36.64	39.94

Table 2: % accuracy of 3-class classification for Bengali on 10-fold cross-validation on the training data. AW = all words, NS = all words except stop words, OS = only stop words. AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.

Feature Representation	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
D: /D /A1	Surface features		64.79	75.79	66.99	75.1	78.4	65.75
Binary (Presence/Absence)	SentiWordNet		76.89	76.89	76.89	76.89	76.89	76.89
	Word unigrams	AW	78.68	81.57	76.62	79.92	76.89	80.61
		NS	73.04	80.33	75.93	79.78	76.89	79.78
		OS	73.59	74.97	67.68	76.89	76.89	71.53
	Word bigrams	AW	35.49	78.82	77.17	78.82	76.89	79.23
		NS	29.57	78.95	78.68	78.95	76.89	78.82
		OS	67.26	78.4	58.46	66.99	76.89	68.5
	Word trigrams	AW	28.2	78.68	78.54	78.82	76.89	78.82
		NS	30.4	78.68	78.82	78.82	76.89	78.95
		OS	46.22	78.4	77.44	75.93	76.89	76.48
	Character unigrams	AC	69.74	75.52	68.09	78.27	76.89	74.42
	Character unigrams	SS	69.88					
		PP		75.52	68.5	77.99	76.89	74.42
			69.46	75.93	68.5	78.13	76.89	75.38
	a	SP	69.46	75.93	67.4	77.99	76.89	75.38
	Character bigrams	AC	75.24	76.48	71.11	78.82	76.89	70.29
		SS	75.1	75.24	69.19	78.13	76.89	71.11
		PP	74.42	77.17	70.84	78.95	76.89	73.18
		SP	74.83	75.93	69.88	78.4	76.89	72.21
	Character trigrams	AC	76.2	74.83	73.45	79.23	76.89	71.25
		SS	76.07	75.38	74.55	79.23	76.89	70.7
		PP	75.93	75.24	71.66	79.37	76.89	70.84
		SP	76.34	75.79	74.0	78.95	76.89	68.5
TOC (TO TO	C CYL DI	SF						
Tf (Term Frequency)	SentiWordNet		76.89	76.89	76.89	76.89	76.89	76.89
	Word unigrams	AW	78.4	79.78	75.24	79.37	76.89	77.99
		NS	71.66	80.06	76.75	79.5	76.89	79.78
		OS	71.94	75.52	68.64	77.99	76.89	71.94
	Word bigrams	AW	35.63	78.82	77.99	78.95	76.89	79.23
		NS	29.71	78.95	78.4	78.95	76.89	78.82
		OS	66.85	78.4	60.52	66.16	76.89	68.78
	Word trigrams	AW	28.2	78.68	78.82	78.82	76.89	78.82
	Word digrams	NS NS	30.4	78.68	78.68	78.82	76.89	78.95
		OS	46.22					
	GI .			78.4	77.03	76.07	76.89	76.48
	Character unigrams	AC	66.99	75.1	65.47	78.27	77.85	68.64
		SS	66.71	75.65	67.26	78.4	77.3	72.9
		PP	69.33	76.75	67.4	78.54	77.99	69.33
		SP	69.19	76.89	66.57	78.54	77.85	67.95
	Character bigrams	AC	73.04	72.9	68.78	78.68	76.89	69.88
		SS	73.04	74.97	67.26	77.85	76.89	71.8
		PP	72.9	74.55	69.05	78.4	76.89	71.8
		SP	73.59	77.58	68.36	78.13	76.89	69.88
	Character trigrams	AC	75.38	71.8		78.15	76.89	
	Character trigrams				70.7			70.15
		SS	75.52	74.28	68.78	78.82	76.89	70.15
		PP	76.34	72.9	67.81	78.82	76.89	69.46
		SP	75.1	76.75	70.43	78.4	76.89	69.33
Tfidf (Term Frequency	SentiWordNet		76.89	76.89	76.89	76.89	76.89	76.89
Inverse Document Frequency)	Word unigrams	AW	53.23	81.43	76.34	79.37	76.89	79.64
•	_	NS	48.56	80.74	76.75	79.5	76.89	80.33
		OS	62.04	69.74	67.68	77.99	77.03	69.74
	Word bigrams	AW	27.79	79.37	76.89	78.95	76.89	79.5
	3.5.5.5.5.5.5.5.5.5.5.5.5.5.5.5.5.5.5.5	NS	27.79	79.09	78.54	78.95	76.89	79.23
		OS	46.35	69.74	61.21	66.16	76.89	63.14
	Word to							
	Word trigrams	AW	27.79	79.09	77.99	78.82	76.89	78.82
		NS	27.1	78.82	78.54	78.82	76.89	78.82
		OS	31.64	75.24	77.3	76.07	76.89	76.07
	Character unigrams	AC	71.53	74.42	67.68	78.68	78.68	73.73
		SS	71.53	74.42	69.88	77.99	78.68	73.59
		PP	72.49	75.52	68.91	78.68	78.68	75.52
		SP	72.49	75.52	68.23	78.82	78.68	75.65
	Character bigrams	AC	65.61	71.94	67.81	78.95	77.03	67.26
		SS	66.02	73.04	68.09	78.54	77.03	66.71
		PP						69.6
			65.47	72.76	67.26	78.82	77.03	
		SP	65.34	72.76	67.81	78.4	77.03	68.91
		A('	62.59	74.14	69.88	78.95	76.89	70.7
	Character trigrams	AC						
	Character trigrams	SS	60.11	73.59	67.4	78.82	76.89	69.46
	Character trigrams				67.4 68.78	78.82 78.82	76.89 76.89	69.46 69.19

Table 3: % accuracy of 2-class classification for Hindi on 10-fold cross-validation on the training data. AW = all words, NS = all words except stop words, OS = only stop words. AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.

Binary (Presence/Absence)	Feature Representation	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
Word unigrams		Surface features		41.82	48.2	43.86	45.99	46.4	33.47
NS	Binary (Presence/Absence)								
Nord bigrams		Word unigrams							
Word bigrams									
NS									
Word trigrams		Word bigrams		25.2	52.45	48.28	47.95	45.74	52.86
Word trigrams				21.19	46.07	43.45	47.71	45.74	46.64
NS 22,75 47,71 43,7 44,27 45,74 46,15			OS	44.68	50.49	46.15	48.12	45.74	47.3
NS 22.75 47.71 43.7 44.27 45.74 44.15		Word trigrams	AW	19.23	47.05	45.5	45.74	45.74	45.91
Character unigrams			NS		47.71	43.7	44.27	45.74	44.35
Character unigrams AC			OS						46.15
SS		Character unigrams							50.82
PP									
Character bigrams			PP						
Character bigrams									
SS 47.71 49.51 43.45 51.72 45.74 46.55 PP		Character bigrams							
PP		Character orgrans							
Character trigrams									
Character trigrams									
SS		Character trigrams							
PP		Character trigrams							
SP									
Tf (Term Frequency)									
Word unigrams	TEC (TE E	C 'M' DI	SP						
NS	11 (Term Frequency)		4.77						
Word bigrams		Word unigrams							
Word bigrams									
NS									
Nord trigrams		Word bigrams							
Word trigrams									
NS 22.67 47.63 44.11 44.35 45.74 44.44 OS 33.72 46.24 43.54 45.5 45.74 45.91 Character unigrams AC 43.78 49.18 41.9 50.57 48.04 PP 45.58 48.28 42.72 50.16 47.55 41.98 SP 45.66 48.04 43.04 50.65 47.38 43.78 Character bigrams AC 46.48 49.35 42.23 53.03 49.02 46.23 SS 46.97 48.36 43.94 52.37 49.26 45.5 PP 46.64 50.74 44.84 53.68 49.1 47.22 SP 47.14 50.33 44.68 51.8 47.95 46.48 Character trigrams AC 49.35 50.49 43.86 52.7 49.18 47.95 SS 47.79 44.84 53.27 49.26 46.97 FP 50.33 49.67 44.84 53.27 49.26 46.97 FP 50.33 49.67 44.84 53.27 49.26 46.97 FP 50.33 49.67 44.84 53.27 49.26 46.97 FP 48.12 49.51 43.7 51.77 48.58 46.32 Tfidf (Term Frequency SentiWordNet Word unigrams AW 38.05 56.38 49.18 55.81 45.74 55.07 NS 35.6 55.07 48.2 52.13 45.74 54.34 OS 43.37 48.69 41.33 47.63 49.02 49.1 Word bigrams AW 17.27 53.68 47.22 49.35 45.74 54.34 OS 31.26 46.07 44.93 44.35 45.74 45.74 45.74 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 45.74 45.74 OS 19.8 46.07 44.44 45.5 45.74 45.74 45.74 OS 19.8 46.07 44.44 45.5 45.74 45.74 OS 19.8 46.07 44.44 45.5 45.74 45.74 OS 19.8 46.07 44.44 45.5 45.74 45.17 Character unigrams AC 45.17 50.08 44.68 51.15 51.8 49.94 Character bigrams AC 45.17 50.08 44.68 51.15 51.8 49.94 Character trigrams AC 44.68 46.81 47.5 50.82 47.33 45.91 Character trigrams AC 41.0 46.81 47.5 50.82 47.33 45.91 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.65 OS 49.43 46.44 42.72 52.86 46.32 42.96 OS 49.43 46.44 42.72 52.86 46.32 42.96 OS 49.43 49.43 50.37 50.90 OS 49.43									
Character unigrams AC AC A3.78 A3.72 A3.62 AC A3.78 A3.78 AC AC A3.78 AC AC		Word trigrams							
Character unigrams				22.67	47.63	44.11	44.35	45.74	44.44
SS				33.72	46.24	43.54	45.5	45.74	45.91
PP		Character unigrams		43.78	49.18	41.9	50.57	48.04	44.44
SP		_	SS	43.45	49.59	43.62	49.59	47.63	45.17
Character bigrams			PP	45.58	48.28	42.72	50.16	47.55	41.98
SS			SP	45.66	48.04	43.04	50.65	47.38	43.78
SS		Character bigrams	AC	46.48	49.35	42.23		49.02	46.32
PP			SS	46.97	48.36	43.94	52.37	49.26	45.5
Character trigrams				46.64		44.84			
Character trigrams									
SS		Character trigrams							
PP		Character trigrams							
Tfidf (Term Frequency Inverse Document Frequency) SentiWordNet Word unigrams AW 38.05 56.38 49.18 55.81 45.74 54.34 55.07 NS 35.6 55.07 48.2 52.13 45.74 54.34 54.34 Word bigrams AW 17.27 53.68 47.22 49.35 45.74 53.19 NS 17.02 47.14 43.62 47.71 45.74 45.01 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 45.01 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 45.01 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 44.44 NS 16.45 44.27 44.03 44.35 45.74 45.17 Character unigrams AC 45.17 50.08 43.37 50.9 50.08 49.43 SS 45.17 50.08 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.35 51.8 48.94 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 Character trigrams AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SS 40.43 46.4 42.77 50.08 44.68 51.15 51.8 49.35 Character trigrams AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SS 40.43 46.4 42.77 50.08 44.68 51.37 52.7 46.15 43.86 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34									
Tfidf (Term Frequency Inverse Document Frequency)									
Inverse Document Frequency Word unigrams	Tfidf (Tarm Fraguency	Santi Word Nat	51						
NS	Inverse Document Fraguency		ΔW						
Word bigrams AW 17.27 53.68 47.22 49.35 45.74 53.19 NS 17.02 47.14 43.62 47.71 45.74 46.64 OS 31.26 46.07 45.99 49.35 45.74 45.01 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 44.44 NS 16.45 44.27 44.03 44.35 45.74 45.17 Character unigrams AC 45.17 50.08 43.37 50.9 50.08 49.43 SS 45.17 50.08 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.15 51.8 48.94 SP 46.15 48.69 44.44 51.31 51.8 49.35 Character bigrams AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34	inverse Document Frequency)	TOTA unigiants							
Word bigrams									
NS 17.02 47.14 43.62 47.71 45.74 46.64 OS 31.26 46.07 45.99 49.35 45.74 45.01 Word trigrams AW 16.86 46.32 45.58 45.91 45.74 44.44 NS 16.45 44.27 44.03 44.35 45.74 43.86 OS 19.8 46.07 44.44 45.5 45.74 45.17 Character unigrams AC 45.17 50.08 43.37 50.9 50.08 49.43 SS 45.17 50.08 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.15 51.8 48.94 SP 46.15 48.69 44.44 51.31 51.8 49.35 Character bigrams AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SP 41.65 48.77 44.19 50.41 46.89 47.22 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34		Word bigrams							
Word trigrams OS		word bigrains							
Word trigrams AW NS 16.86 46.32 45.58 45.91 45.74 44.44 NS 16.45 44.27 44.03 44.35 45.74 43.86 OS 19.8 46.07 44.44 45.5 45.74 45.17 S0.08 43.37 50.9 50.08 49.43 SS 45.17 50.08 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.15 51.8 48.94 SP 46.15 48.69 44.44 51.31 51.8 49.35 Character bigrams AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SP 41.65 48.77 44.19 50.41 46.89 47.22 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34									
NS OS 16.45 44.27 44.03 44.35 45.74 43.86 OS 19.8 46.07 44.44 45.5 45.74 45.17 50.08 43.37 50.9 50.08 49.43 SS 45.17 50.08 44.68 51.39 50.0 49.51 PP 46.24 48.69 44.68 51.15 51.8 48.94 SP 46.15 48.69 44.44 51.31 51.8 49.35 AC 43.45 45.99 44.93 52.62 46.81 42.64 SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SP 41.65 48.77 44.19 50.41 46.89 47.22 Character trigrams AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34		Word to:							
Character unigrams OS 19.8		word ungrams							
Character unigrams AC SS 45.17 50.08 43.37 50.9 50.08 49.43 49.51 PP 46.24 48.69 44.68 51.15 51.8 48.94 49.35 Character bigrams AC SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 AC SS 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 AC SS 40.43 46.81 45.5 50.82 47.38 45.91 AC 41.0 46.81 43.7 52.7 46.15 43.86 AC SS 39.69 46.97 43.21 51.72 46.15 44.03 45.34			1/2						
SS		GI .							
Character bigrams Character trigrams PP		Character unigrams	AC						
Character bigrams									
Character bigrams AC SS 40.43 45.99 44.93 52.62 46.81 42.64 40.43 46.4 42.72 52.86 46.32 42.96 PP 42.64 46.81 45.5 50.82 47.38 45.91 SP 41.65 48.77 44.19 50.41 46.89 47.22 AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34									
SS									
Character trigrams PP 42.64 46.81 45.5 50.82 47.38 45.91 SP 41.65 48.77 44.19 50.41 46.89 47.22 AC 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34		Character bigrams	AC						
Character trigrams SP 41.65 48.77 44.19 50.41 46.89 47.22 41.0 46.81 43.7 52.7 46.15 43.86 SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34									42.96
Character trigrams AC SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34					46.81	45.5	50.82		45.91
Character trigrams AC SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34				41.65	48.77	44.19	50.41	46.89	47.22
SS 39.69 46.97 43.21 51.72 46.15 44.03 PP 40.26 48.45 43.94 53.27 46.07 45.34		Character trigrams		41.0	46.81	43.7	52.7	46.15	43.86
PP 40.26 48.45 43.94 53.27 46.07 45.34			SS	39.69	46.97	43.21	51.72	46.15	44.03
				40.26	48.45	43.94			45.34
$_{1}$			SP	38.95	46.89	42.96	51.47	46.15	44.68

Table 4: % accuracy of 3-class classification for Hindi on 10-fold cross-validation on the training data. AW = all words, NS = all words except stop words, OS = only stop words. AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.

Feature Representation	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
	Surface features		53.06	56.47	50.64	54.48	54.34	51.92
Binary (Presence/Absence)	SentiWordNet		55.05	55.05	55.05	55.05	55.05	55.05
	Word unigrams	AW	62.16	60.17	56.76	57.61	55.05	59.46
	Word bigrams	AW	49.36	56.9	56.19	56.76	55.05	55.76
	Word trigrams	AW	44.95	57.04	56.76	56.9	55.05	57.18
	Character unigrams	AC	57.89	58.04	49.22	57.18	57.47	58.46
		SS	57.89	58.04	50.64	57.61	57.61	58.46
		PP	57.04	55.48	50.36	55.76	57.33	56.47
		SP	56.76	55.76	51.64	57.04	57.18	56.61
	Character bigrams	AC	58.32	57.18	53.49	59.89	55.05	52.35
	8	SS	59.46	57.04	49.93	59.17	55.05	53.63
		PP	55.48	54.62	52.49	59.74	55.05	54.91
		SP	55.76	55.33	53.91	59.89	55.05	55.62
	Character trigrams	AC	56.9	55.05	54.05	60.31	55.05	52.2
	Character trigrams	SS	58.32	57.75	55.76	59.89	55.05	56.47
		PP	56.05	53.34	53.77	59.6	55.05	52.06
		SP	56.33	56.05	55.62	57.04	55.05	54.34
Tf (Term Frequency)	SentiWordNet	51	55.05	55.05	55.05	55.05	55.05	55.05
(Term Frequency)	Word unigrams	AW	61.74	60.17	58.89	59.03	55.05	58.61
	Word bigrams	AW	49.64	56.9	56.61	56.76	55.05	55.9
	Word trigrams	AW	44.81	57.04	56.61	56.9	55.05	57.18
	Character unigrams	AC	57.18	55.33	54.34	59.74	57.89	52.63
	Character unigrams	SS	56.9	55.62	57.47	57.61	57.75	47.51
		PP	56.33	53.77	56.05	57.18	57.61	53.49
		SP	56.19	53.63	54.05	56.61	57.18	51.64
	Character bigrams	AC	59.03	56.19	55.9	59.46	58.46	52.35
	Character digitalits	SS	56.47	57.75	53.49	58.89	58.61	53.49
		PP	57.61	55.05	50.36	59.17	58.61	52.63
		SP	56.76	56.05	52.35	58.46	58.04	54.91
	Character trigrams	AC	59.03	57.75	55.19	60.03	53.2	52.49
	Character trigrams	SS	57.61	59.32	51.21	58.75	52.92	56.33
		PP	58.18	56.05	55.05	58.04	54.34	52.49
		SP	57.47	57.04	52.49	58.18	54.91	55.76
Tfidf (Term Frequency	SentiWordNet	31	55.05	55.05	55.05	55.05	55.05	55.05
Inverse Document Frequency)	Word unigrams	AW	58.32	59.6	56.61	59.03	55.05	58.75
inverse Document Frequency)	Word bigrams	AW	48.08	55.76	56.47	56.76	55.05	55.9
	0	AW	46.09	57.04	56.61	56.9	55.05	55.76
	Word trigrams							
	Character unigrams	AC	53.2	53.77	56.05	58.46	59.03	54.05 53.63
		SS PP	53.2	53.77	55.62	58.61 56.76	59.17	
		SP	51.49	54.34	54.77	56.76	57.89 57.75	53.77
	Chamaatan biana		51.49	54.34	54.05	57.89	57.75	54.2
	Character bigrams	AC SS	57.04	54.2	53.06	59.03	54.77	50.64
			56.61	55.62	53.91	59.03	54.91	53.63
		PP	55.33	54.91	50.21	57.75	54.77	57.18
	Cl	SP	54.34	56.33	55.76	58.61	54.77	56.76
	Character trigrams	AC	54.34	53.2	54.62	60.03	55.05	51.21
		SS	54.62	54.91	50.92	58.75	55.05	53.91
		PP	53.06	53.49	55.33	58.04	55.05	52.35
		SP	51.21	55.62	52.77	58.18	55.05	56.19

Table 5: % accuracy of 2-class classification for Tamil on 10-fold cross-validation on the training data. AW = all words (for Tamil, we did not have stop words). AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.

Feature Representation	Feature Category	Feature Type	NB	LR	DT	RF	SV	LS
	Surface features		39.08	43.52	34.27	37.17	39.17	36.9
Binary (Presence/Absence)	SentiWordNet		36.26	36.26	36.26	36.26	36.26	36.26
	Word unigrams	AW	40.71	39.53	39.26	42.07	36.26	38.8
	Word bigrams	AW	36.08	40.25	38.08	39.26	36.26	40.34
	Word trigrams	AW	30.92	37.99	37.35	37.99	36.26	38.17
	Character unigrams	AC	43.52	40.98	36.08	43.16	43.25	40.71
		SS	43.52	41.07	36.9	44.15	43.34	40.34
		PP	43.25	41.25	39.98	41.07	43.16	40.62
		SP	43.43	41.25	39.44	39.89	43.06	40.34
	Character bigrams	AC	42.25	41.34	39.89	43.61	36.26	37.81
		SS	41.7	41.34	37.81	44.24	36.26	39.44
		PP	39.17	39.08	39.98	42.52	36.26	38.89
		SP	39.44	40.07	37.81	41.61	36.26	40.16
	Character trigrams	AC	39.26	38.8	37.53	43.34	36.26	35.63
	Character trigrams	SS	39.89	41.98	37.53	43.16	36.26	39.89
		PP	38.44	39.26	37.99	40.89	36.26	38.53
		SP	38.62	40.98	35.9	41.98	36.26	38.89
Tf (Term Frequency)	SentiWordNet	51	36.26	36.26	36.26	36.26	36.26	36.26
Tr (remirrequency)	Word unigrams	AW	40.62	40.16	39.8	38.8	36.26	38.17
	Word bigrams	AW	36.08	40.44	39.08	39.17	36.26	39.89
	Word trigrams	AW	30.92	37.99	37.53	37.99	36.26	38.17
	Character unigrams	AC	44.24	40.07	37.08	45.24	39.71	37.99
	Character unigranis	SS	44.24	40.16	35.99	43.79	39.44	36.9
		PP	43.79	39.62	36.36	42.43	38.44	37.26
		SP	43.79	39.02	34.81	44.15	39.62	36.45
	Character bigrams	AC	43.61	41.7	39.44	44.15	41.34	38.89
	Character digrams	SS	41.89	39.98	35.81	44.00	41.34	39.08
		PP	42.7	40.34	38.08	41.98	41.34	40.62
		SP	41.43	41.43	36.81	43.43	41.54	38.8
	Character trigrams	AC	40.62	40.62	36.81	40.34	40.89	37.35
	Character trigrams	SS						
		PP	40.16	42.43	36.9	42.52	40.89	40.25
		SP	39.98	41.43	35.99	39.62	40.34	38.8
TC IC /T	C C'IV IN C	SP	40.16	41.98	38.8	40.34	39.98	41.89
Tfidf (Term Frequency	SentiWordNet	A 3 3 7	36.26	36.26	36.26	36.26	36.26	36.26
Inverse Document Frequency)	Word unigrams	AW	40.16	39.8	39.26	38.8	36.26	38.26
	Word bigrams	AW	33.18	41.25	38.62	39.17	36.26	40.89
	Word trigrams	AW	29.83	38.17	37.26	37.99	36.26	38.17
	Character unigrams	AC	40.98	40.53	36.63	43.79	41.8	40.8
		SS	40.98	40.53	36.36	44.51	41.8	40.98
		PP	40.44	40.25	34.81	41.8	43.34	40.34
		SP	40.44	40.25	35.27	43.16	43.16	39.98
	Character bigrams	AC	38.98	38.62	38.26	43.79	42.25	36.99
		SS	37.81	38.62	35.63	42.16	42.07	38.08
		PP	36.99	38.53	39.08	42.34	41.25	39.53
		SP	36.9	41.7	35.99	41.89	41.07	41.25
	Character trigrams	AC	37.53	38.35	36.63	40.34	40.34	35.54
		SS	37.08	39.35	38.53	42.52	38.53	36.63
		PP	36.54	39.35	36.54	39.62	40.25	37.9
	<u> </u>	SP	35.9	41.34	39.44	40.34	38.26	38.89

Table 6: % accuracy of 3-class classification for Tamil on 10-fold cross-validation on the training data. AW = all words (for Tamil, we did not have stop words). AC = all characters, SS = all characters except space, PP = all characters except punctuation, SP = all characters except space and punctuation.